Working Set Theorems for Routing in Self-Adjusting Skip List Networks

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Context: Self-Adjusting Networks

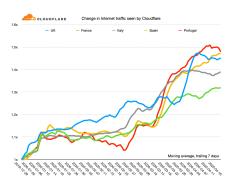
Goal: adjust a non-tree topology over unknown demand,

minimize routing+adjustment costs



Data center traffic on the rise

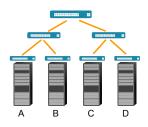
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- internet/data center traffic is increasing (even more in lockdowns!)
- packet switch bandwidth is increasing slower than the traffic increase rate!

A look inside: data center interconnects

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- data center top-of-the rack switch interconnects are currently static
- good design only for uniform demand patterns
- what if there is "elephant" traffic between (A, C) and (B, D)?
- Demand is skewed! [BAM10, GMP+16]
- Need dynamic physical topologies!



Hardware support for dynamic connectivity

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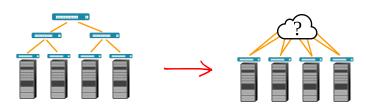


- dynamic physical topologies so far use: circuit switches, 60 GHz wireless, and free-space optics [GMP+16]
- large number of topologies are possible (high maximum degree), low reconfiguration time

How should topology adjust over time to better serve the demand?

Emergence of Self-adjusting Networks (SANs)

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Challenges:

- I How should topology change upon serving a request?
- 2 Is it possible to support **non tree-based** topologies? existing work focuses on tree-based topologies, e.g. SplayNet [SAS+16]
- **3** What are the **performance** guarantees?



- 1 Model
- 2 Self-Adjusting Skip List Networks
- 3 Proving working set property
- 4 Concurrent requests



1 Model

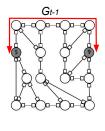
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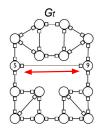


Input: G_0 an initial graph, $\sigma = (\sigma_1, \sigma_2, \dots, \sigma_m)$ a sequence of communication requests

An **online SAN algorithm** A takes input G_0 and upon $\sigma_t = (s_t, d_t)$

- \blacksquare serves σ_t
- decides how to transform G_{t-1} to G_t





Based on [SAS+16, AS19]

Model

• $cost(\sigma_t)$: routing cost in G_{t-1} + cost of adjusting G_{t-1} to G_t

(pairwise) working bag $WB(\sigma_t)$: smallest subsequence ending in σ_{t-1} that contains both source and destination of σ_t

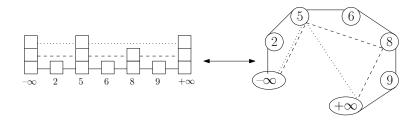
(pairwise) working set $WS(\sigma_t)$: distinct elements in working bag (pairwise) working set number $|WS(\sigma_t)|$: size of working set

(pairwise) working set property: $\forall \sigma_t$: $cost(\sigma_t) = \mathcal{O}(\log |WS(\sigma_t)|)$

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Self-Adjusting Skip List Networks

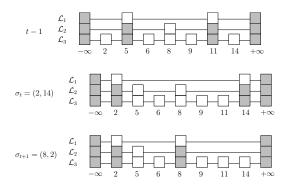


- element/link of the skip list = node/edge in graph (no duplicates)
- routing according to skip list finger search
- Good fit for networks due to: local routing, more resilient to link failures than trees, alternative to tree-based self-adjusting networks

SASL²: Self-Adjusting Skip List Network

Self-Adjusting Skip List Networks

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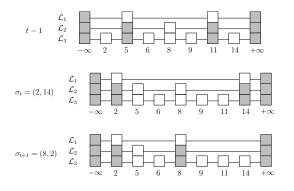


- based on SASL, a statically optimal (for search sequences)
 self-adjusting skip list by Ciriani et al. [CFLM07]
- adjustment: promotion/demotion of nodes:
 - higher levels ⇒ shortest distance

SASL²: Self-Adjusting Skip List Network

Self-Adjusting Skip List Networks

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 $SASL^2$: upon request (s, d): route (s, d), adjust(s), adjust(d)

- demoted nodes selected uniformly at random
- demotion is graceful and proportional to originating level

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Step 1: Working set property for *SASL*

Fix a **search** request σ_i

Consider working bag of size $T: (\sigma_{i-T+1}, \dots, \sigma_i)$

[CFLM07]: items in working bag pushed down $\mathcal{O}(\log T)$ bands **This work**: items in working bag pushed down $\mathcal{O}(\log |WS(\sigma_i)|)$ bands $\implies SASL$ has the working set property!

Proving working set property

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Step 2: Extending to *SASL*²

Fix a communication request σ_i

Consider working bag of size $T: (\sigma_{i-T+1}..., \sigma_i)$

Step 2a: convert to sequence of search requests $(s_{i-T+1}, d_{i-T+1}, \ldots, s_i, d_i)$, where $\sigma_t = (s_t, d_t)$

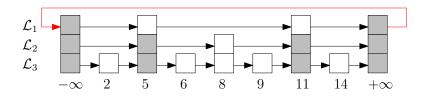
Step 2b: apply pairwise working set property definition!

$$\begin{cases}
\mathcal{L}_{1} \} = \mathcal{B}_{1} \overline{s_{i-1} \ d_{i-1}} \\
\mathcal{L}_{2}, \mathcal{L}_{3} \} = \mathcal{B}_{2} \overline{s_{i-2}} \\
\vdots & \vdots & \vdots \\
\mathcal{L}_{2^{k-1}}, \dots, \mathcal{L}_{2^{k-1}} \} = \mathcal{B}_{k} \overline{s_{i-T+1} \quad s_{i-T+2} \atop d_{i-T+1} \quad d_{i-T+2}} \\
\vdots & \vdots & \vdots \\
\mathcal{B}_{b} \overline{s_{i-T+1} \quad s_{i-T+2} \atop d_{i-T+2}}
\end{cases}$$

$$b = \Theta(\log \log n)$$

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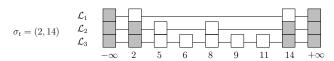




- Combine *SASL*² with a **concurrent skip list implementation**, e.g. Herlihy et al. [HLLS07]
- Routing: use search routine (findNode())
- Node promotion/demotion: use modified node add/delete routines

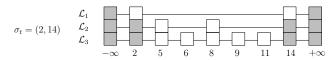
Wrap-up

- Existing/developing technology supports dynamic physical topologies
 [GMP+16]
- Our contribution: a self-adjusting skip list network with the (pairwise) working set property



- Lower bounds? (beyond the ones in SplayNet [SAS+16])
- Extend other data structures to SANs

- Existing/developing technology supports dynamic physical topologies [GMP+16]
- Our contribution: a self-adjusting skip list network with the (pairwise) working set property



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